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Polarization sensitive optical coherence tomography with single input for imaging depth-resolved collagen organizations

Peijun Tang¹, Mitchell A. Kirby¹, Nhan Le[®]¹, Yuandong Li¹, Nicole Zeinstra¹, G. Nina Lu[®]², Charles E. Murry^{1,3,4,5}, Ying Zheng^{1,5} and Ruikang K. Wang[®]^{1,6}

Abstract

Collagen organization plays an important role in maintaining structural integrity and determining tissue function. Polarization-sensitive optical coherence tomography (PSOCT) is a promising noninvasive three-dimensional imaging tool for mapping collagen organization in vivo. While PSOCT systems with multiple polarization inputs have demonstrated the ability to visualize depth-resolved collagen organization, systems, which use a single input polarization state have not yet demonstrated sufficient reconstruction quality. Herein we describe a PSOCT based polarization state transmission model that reveals the depth-dependent polarization state evolution of light backscattered within a birefringent sample. Based on this model, we propose a polarization state tracing method that relies on a discrete differential geometric analysis of the evolution of the polarization state. We demonstrate the ability of this method to visualize depth-resolved myocardial architecture in both healthy and infarcted rodent hearts (ex vivo) and collagen structures responsible for skin tension lines at various anatomical locations on the face of a healthy human volunteer (in vivo).

Introduction

Collagen, often organized in the form of fibers, is a structural protein widely distributed in biological tissue¹. Its organization plays an important role in biomechanical structure and function. For example, the alignment of dermal collagen contributes to anisotropic tensile strength in human skin tissue (related to Relaxed Skin Tension Lines (RSTLs)) which provides both protection and tailored flexibility^{2,3}. Collagen organization also reveals important physiologic function in tissue such as the heart, where its organization contributes to unique contractile muscular behavior^{4,5}. In cases where collagen

networks have been disrupted, such as after myocardial infarction, subsequent functional decline has been documented^{4,5}. Such examples suggest that insights into biological and pathological structure-function relationships may be elucidated, and even used to drive clinical intervention, based on depth-resolved identification of collagen fiber organization.

While techniques, such as polarized light microscopy, have been utilized to image collagen fibers in an ex vivo setting, many require tissue sectioning procedures^{6,7}. To achieve in vivo collagen imaging, techniques such as second harmonic generation (SHG) confocal-type microscopy have been developed to visualize and analyze depth-resolved collagen organization^{8–11}. However, the field of view (FOV) (up to ~500×500 μ m²) and imaging depth (up to ~200 μ m) are often too limited to reconstruct macroscopic collagen organizations that reveal the functional architecture of the tissue. Clearly,

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Correspondence: Ruikang K. Wang (wangrk@uw.edu)

¹Department of Bioengineering, University of Washington, 3720 15th Ave NE, Seattle, WA 98195, USA

²Department of Otolaryngology- Head and Neck Surgery, Facial Plastic and Reconstructive Surgery, University of Washington, Seattle, WA 98195, USA Full list of author information is available at the end of the article

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a technique capable of wide-field three-dimensional (3D) imaging of collagen structures in living tissue would provide rich information on how collagen organization relates to physiologic function.

Polarization-sensitive optical coherence tomography $(PSOCT)^{11-16}$ is a promising technique that enables noninvasive 3D mapping of birefringent material. Since fibrous collagen is highly birefringent, PSOCT can contrast collagen structure with a wide FOV (from a few to tens of square centimeters), relatively deep imaging depth (up to ~2 mm) and fast imaging speed (seconds per 3D scan)^{17–20}. However, traditional PSOCT provides only accumulated polarization information along depth due to that back-scattered light must pass through tissue twice before detection. Such accumulation can make it difficult to interpret the birefringent properties of the sample.

An elegant Jones matrix-based algorithm was developed to map local axis orientation using a single incident polarization state²¹, in which local axis orientation is considered as a scalar constrained within QU-plane. However, the asymmetry in the imaging system (i.e., the optical path in the system is not in round-trip) can cause an overall rotation of the optic axes away from the QUplane^{14,22–24}. That is, the local axis orientation to be measured becomes a 3D vector in Stokes space. As such, the algorithm would result in inaccurate determination of the local axis orientation and local phase retardation over depth.

The 3D local axis orientation in Stokes space can also be achieved by using two distinct incident polarization states in the measurements^{14,18,25}, which can practically be realized by additional hardware modules that, however, reduce the imaging range by half^{11,19}, or are expensive, and require additional hardware control which can complicate the imaging system setup^{25–27}.

Rather than using the Jones matrix model to describe the birefringent property, here we propose a PSOCTbased polarization state transmission model that leverages the Poincare sphere to describe the evolving polarization state of an incident beam as it travels through a birefringent sample with depth-varying optic axes and phase retardation in a round-trip measurement. Based on this transmission model, we describe a novel method where the 3D local axis orientation in the Stokes space can be obtained with only one single input polarization state, giving depth-resolved collagen imaging with sufficient imaging quality. The technical challenges of resolving birefringent information (i.e., local phase retardation and 3D local axis orientation in the Stokes space) along the depth with a single input polarization are addressed using a discrete differential geometry (DDG) based polarization state tracing (PST) method combined with a series of 3D rotation operations in the transmission model. Without the requirement of multiple input polarization states, this method can simplify the imaging system setup and mitigate motion artifact, being aimed for clinical translation.

Using this method, we demonstrate depth-resolved mapping of the birefringent properties (largely determined by collagen organization) in ex vivo rodent hearts and in healthy human skin, in vivo. For the ex vivo study, fiber disorganization is detected within an infarct rodent heart using the proposed depth-resolved collagen organization imaging method. For the in vivo study, we demonstrate depth-resolved collagen organization imaging in healthy human skin to reveal the facial skin tension lines.

Results

To validate and demonstrate the usefulness of the proposed method, we first established a swept source PSOCT system (Fig. S1) operating at 1310 nm wavelength with an axial resolution of 7.5 μ m in air (See Supplementary Section S1). With this system, the proposed DDG-based PST method was validated using a custom-made thin strip phantom of polylactic acid (PLA) 3D printer filaments, which exhibit intrinsic homogeneous birefringence with its fast optic axis parallel to the filament's axis²⁸ (see Supplementary Section S2). The measured optic axis maps agreed with expected values (Figs. S2 and S3), demonstrating the validity of the proposed method to derive depth-resolved relative optic axis orientation.

Since fibrous collagen shows intrinsic optical anisotropy, axis orientation mapping can be utilized to extract the collagen organization from the tissue with high contrast and provide orientation information of collagen alignment^{29–31}. Next, we demonstrate depth-resolved collagen organization imaging of several samples of importance using the proposed method. In all collagen orientation results below, we used the same colormap (Supplementary Section S2) to avoid possible confusion. The 0 deg is defined as the sample orientation when it is parallel to the B-scan direction (i.e., fast scanning direction). To reduce noise, a spatial averaging filter (4 × 4 pixels, x × y) was applied to the en-face and the crosssectional (x × z) optic axis orientation images.

Ex-vivo imaging of healthy mouse heart

To demonstrate the ability of the DDG-based PST method to visualize collagen organization, a whole mouse heart was imaged by the PSOCT system with a lateral resolution of 22 μ m (details see Supplementary Section S3) within 1 h of extraction. Figure 1 shows a 3D rendered PSOCT volume of the whole heart obtained from stitching separate en-face axis orientation images (50 μ m below the heart surface) acquired at 12 perspective angles (Supplementary Section S3). In this image, streamlines obtained by the local axis orientation



values are used to represent the fiber tracts and show the skeleton structures in the spatial organization of fiber bundles. The result depicts the myocardial fiber organization of the superficial tissue of the whole mouse heart, where a typical helical-like myocardial fiber structure was reconstructed by the DDG-based PST method, demonstrating the ability of the proposed method to reconstruct myocardial fiber orientations.

Taking advantages of the wide FOV of the current PSOCT system, the relative fiber orientations among different parts of the heart were visualized in a macroscopic view. The myocardial fiber organization of left ventricle (LV) (Figs. 1a, 1b, and 1d), right ventricle (RV) (Figs. 1a, 1c and 1d) and the two boundaries between the RV and LV: the anterior interventricular sulcus (AIVS) (white dash line in Fig. 1a) and the posterior interventricular sulcus (white dash line in PIVS) (Fig. 1d) are presented in an entirety in Fig. 1. The results show the potential for this technique to investigate microstructural foundations which may play a role in the interaction mechanisms between different cardiac tissues.

Ex-vivo imaging of infarct rat heart

Herein we demonstrate the ability of the DDG-based PST method to image collagen orientation and organization in both healthy cardiac tissue and in tissue 4 weeks following an induced infarct event (see Supplementary Section S4). Briefly, one animal was randomly chosen as the healthy sample, and another chosen to undergo a thoracotomy surgery for ischemia/reperfusion of the left anterior descending coronary artery to create a myocardial infarction. Following euthanasia, the aortas of both samples were fixated using 4% paraformaldehyde perfusion prior to PSOCT imaging.

Linear gradient changes in the fiber orientation angle along depth was detected in the healthy heart (Figs. 2a, 2c and 2e), consistent with prior histology studies^{32,33}. In the en-face images (50 µm below the surface) (Fig. 2a) selected at different depths (from 140 to 840 µm relative to tissue surface), the myofiber orientations were highly uniform at each depth and rotated gradually: the mean axis orientation determined from each en-face slice was 159.7° (i.e., -20.3°) $\pm 2.35^{\circ}$, 167.2° (i.e., -12.8°) $\pm 2.30^{\circ}$, 4.19° ($\pm 2.49^{\circ}$), 11.7° (\pm 3.45°) and 45.7° (\pm 4.51°), respectively, with relative small standard deviations. This phenomenon is displayed using a polar histogram plot to visualize the dominant orientation direction and relative distribution of the optic axis at each depth (Fig. 2e). The preferential collagen distribution demonstrates myofibril uniformity and anticlockwise rotation of the dominant fibers along depth. Depth-resolved reconstruction shows the gradient change of the myofibril direction over depth, consistent with the prior histological observations^{32,33}, demonstrating the usefulness of the proposed DDG-based PST method.

However, the infarcted heart exhibited disorganization of the myocardial fibers along the depth within the cardiac



wall (Figs. 2b, 2d and 2f). In the en-face axis orientation images selected at different depths (Fig. 2b), myofibers in the superficial layer (140 μ m relative to the tissue surface) appear uniform, which is similar to the healthy heart (e.g. Figure 2a). With the increase of depth, the fiber orientations show random and discontinuous patterns in the infarcted tissue (Fig. 2b), indicating fibril damage due to the infarct occurred relatively deep within the cardiac wall. The cross-sectional image (Fig. 2d) shows that the collagen fiber disorder begins around 300 µm from the outer wall. Beneath this depth, a linear gradient change in fiber orientation is no longer observed, demonstrating remodeling of the fiber structure after infarction. The orientation distribution of the fibers at each depth in the infarct tissue is shown in the polar histogram (Fig. 2f), where except for the surface layer (140 µm), the distributions of the orientation in the infarct tissue are widely spread in the deeper layers. These results are consistent with histological staining (Fig. S5b), where the superficial tissue of the infarcted heart appears normal (similar to the tissue of the healthy heart (Fig. S5a)) while random fiber structures appear around 300 μ m in depth.

Depth-resolved axis orientation images of healthy and infarcted rat hearts revealed complex myocardial fiber arrangements which differ along the depth of the cardiac wall. The depth-resolved ability of the DDG-based PST method detected physiologic change deep within the cardiac wall. Overall, rodent heart imaging in this work demonstrated that the method can be readily applied to laboratory studies, potentially providing an insight into the physiology and pathology of the biological tissue.

In-vivo imaging of human skin

Relaxed skin tension lines (RSTLs), corresponding to the natural orientation of elastin and collagen fibers, are important for planning and placement of surgical



architecture of collagen organizations at various locations on the human facial skin. **a** Illustration of selected regions (marked as red squares, 1–5) on the human facial skin for representative PSOCT imaging of the relaxed skin tension lines (RSTLs), where 1–5, respectively indicate the facial regions of glabella, lateral eyelid, inferior eyelid, cheek, and upper lip. **b–f** The en-face axis orientation (OAx) PSOCT images (generated by average projection of a 70 µm slab, starting from approximately 105–175 µm depth from the skin surface) acquired from the regions of **b** glabella; **c** Lateral eyelid; **d** Inferior eyelid; **e** cheek; **f** upper lip. **g–k** The corresponding histogram distributions of orientation obtained from the en-face OAx slices measured at **g** glabella; **h** lateral eyelid; **i** inferior eyelid; **j** eye bag; **k** upper lip, respectively, at three different depths (105 µm, 175 µm and 245 µm). White doubleheaded arrow in (B) shows the direction of the body axis. The yellow arrow indicates the B-scan direction, which is defined as the 0°. The scale bar = 500 µm

incisions in facial reconstructive surgery and cosmetology. Because the relative angle between RSTLs and incisions plays a role in the formation of scars^{2,3}, visualizing fiber orientation in human skin tissue may provide surgeons with additional information to both personalize surgical procedures and monitor long term outcomes. To demonstrate the potential of the DDG-based PST method in surgical applications, we imaged multiple anatomical locations (defined according to aesthetic units shown in Fig. 3a) on the face of a healthy adult volunteer (29 years, female, Asian) (see Supplementary Section S5). Two OCT scanning patterns were used for imaging: high-lateral resolution scanning $(11 \,\mu\text{m})$ with a field of view (FOV) of 2 mm×2 mm, and relatively low-lateral resolution scanning (22 µm) with a FOV of 6 mm×6 mm. RSTLs, defined as the direction of greatest tension on the skin and parallel with collagen bundles^{34–36}, were estimated and displayed on the photograph (Fig. 3a) for reference 2,34 .

Woven mesh-like structures formed by varied arrays of collagen bundles were observed in the en-face axis orientation images (Fig.3c–g, produced by depth-averaging a 70 μ m thick slab with its anterior boundary at 100 μ m beneath the skin surface) in each facial region, demonstrating that collagen organization of the skin can be extracted from living tissue using the proposed

technique. In general, a single dominant color was found in the en-face image of each facial region, suggesting alignment of collagen fibers which can be measured and visualized using the DDG-based PST method. Polar histograms (Fig. 3h-k) which present orientation distribution in the en-face image at each depth show that the preferential direction of the collagen fibers is consistent with the general directions of RSTLs as shown in Fig. 3a. We note that the collagen orientation of glabella (Fig. 3g) is orthogonal to the direction of traditional RSTLs. While this may be a feature of the particular volunteer, there remains unanswered questions regarding the relationship between collagen fiber alignment and RSTLs.

These results demonstrate the potential for the DDGbased PST method to guide skin incision placement by visualization patient-specific RSTLs in vivo, further investigate collagen fiber orientation in normal and abnormal states of scar formation, and study collagen disorders of the skin such as Ehler's Danlos syndrome and Scleroderma^{37,38}.

The DDG-based PST method was also used to image depth-resolved features of in vivo facial collagen organization. Two scanning patterns (see Supplementary S5) are used to reveal networks of collagen bundles at different FOVs in the cheek across all depths (Fig. 4a, b).



The mesh-like structure of collagen organization is clearly presented in the local axis orientation images while crossing networks are faintly perceivable in corresponding structural en-face images (obtained by OCT images). In the axis orientation images (Fig. 4a, b), the collagen fibers in the papillary layer (~105 μ m) appear to form a loosened mesh but with an alignment whose orientation is matched with the RSTLs. Multiple arrays of collagen fibers with different orientations are found to form a tight meshwork in the reticular layer (~175 μ m and 245 μ m).

The polarization state image (Fig. 4d) was created using the output polarization states¹² where red, green and blue are used to code the Stokes parameters Q, U and V (respectively) corresponding to the output polarization state in backscattered light. Since the polarization state image reveals comprehensive information (i.e., combining both phase retardation and orientation) of the birefringent sample¹², it can visualize the birefringent component embedded within the tissue with high contrast. The top view of the 3D polarization state image of facial skin (cheek) is provided to visualize the architecture of the collagen fibers as shown in Fig. 4d, the colormap of which is the color-coded Poincare sphere in Fig. S1b–d. Mesh-like woven organization of the collagen fibers are clearly seen. Polarization results taken on other facial areas can be found in the Supplementary Materials (Figs. S6–S9), as well as videos.

These results demonstrate the potential of the proposed method to investigate 3D collagen structure in both macro and micro-scale, potentially connecting how collagen organization maintains the structural integrity of the skin.

Discussion

Clinical translation of PSOCT for depth-resolved imaging of fiber orientations for in vivo imaging requires minimal system complexity, cost-effectiveness and flexibility. The DDG-based PST approach introduced here enables depth-resolved birefringent imaging that only requires one single input polarization state, allowing a generalizable single input PSOCT system setup. Differing from previous multiple input Jones matrix-based measurement^{25,26}, the DDG-based PST approach analyzes the trajectory of the depth evolution of a single input polarization state in the Stokes space.

Due to the inevitable asymmetric property of the imaging system, the optic axis to be measured becomes a 3D vector in the Stokes space rather than a scalar constrained within the QU-plane as described in²². This is because the polarization states scattered back from the sample are routed to the detector that takes a different optical path from the input light being delivered to the sample, leading to a system-induced change in the detected polarization states. The change can be considered as a global rotation to the output polarization states on the Poincare sphere. Based on the rotation model that describes the relation between the evolution of the output polarization states and the optic axis, the measured optic axis becomes a 3D vector in the Stokes space. Since the global rotation would not alter the relative geometrical relationship between the polarization state vectors scattered back from the sample, the relative orientation among the measured optic axes using the proposed PST method can still reveal the relative orientation among the true optic axes within the sample. Hence, compared with the previous work that using a single input polarization state to derive the local phase retardation and local axis orientation in the 2D QUplane²¹, the DDG-based PST approach has an advantage that it can improve the measurement accuracy through determining the local axis orientation in 3D Stokes space (see Supplementary section 6).

The advantage of the DDG-based PST approach over the previous methods that use two input polarization states is that without introducing the additional polarization modulation scheme^{24,27,39}, the requirement of known polarization states incident on the sample can be removed. This is because the DDG-based analysis of the trajectory of the polarization states is not affected by the location of the start point (i.e., the values of the input polarization state). Particularly, for any polarized light (excluding the one parallel to the optic axis of the sample) transmitting through the same region of the sample, its corresponding trajectories of the polarization evolution on the Poincare sphere should share the same set of binormal vectors, which determines the unique local birefringent parameters. This theoretical conclusion also provides a potential ability of the proposed method to relax the requirement for other PSOCT configurations, which is particularly attractive to the efforts that aim for clinical translation.

Another benefit of the proposed method is that it makes it compatible with most PSOCT system designs which utilize a single input polarization state, providing flexibility in system design. Previous studies have shown that different input polarization states have different sensitivities at particular values of optic axis or retardance⁴⁰. Therefore, a general design with flexible selection of the input polarization state⁴⁰ is desirable for achieving the optimal sensitivity when imaging different birefringent samples.

However, there remains an issue to be addressed in the proposed method. It is noted that a transition from one layer to another layer with a distinct difference in optic axis, would result in a false binormal vector at the transition position that is not accurate for any single layer. In this case, the binormal vector is instead an integrated result from both layers. This error can propagate and accumulate when computing the local axis orientation over depth. Because the binormal vector at the transition position does not belong to the upper layer, nor the lower layer, it can be considered as a jitter that can be recognized by the differential method. By removing such points, the estimation error introduced by the interface between different birefringent components can be mitigated.

In most cardiac tissue studies, histology remains the gold-standard method to evaluate myofiber architectures. However, this method is destructive and time consuming. The ability to reconstruct 3D collagen architecture from 2D stacks of histological sections is also challenging. Notably, rat heart imaging was performed following paraformaldehyde fixation which has been known to stiffen tissue based on the induction of collagen cross-links. However, the general helical-like arrangement of collagen tissue appeared to be retained in the healthy heart.

In this study, we note that 22 μ m lateral resolution may not be sufficient for detecting minute changes in collagen organization. Also, it is difficult to observe the dynamics of the myocardial fibers of the whole heart during heart beating because there is a time delay induced by the point scanning protocol when imaging different parts of heart. These two issues can be mitigated simultaneously by integrating the full-field microscopy into the PSOCT system. A high-resolution (~1 μ m) 3D volumetric collagen organization image can be obtained with a single shot rather than point scanning. However, imaging depth would decrease in this case.

Overall, the depth-resolved PSOCT images of myofibers may be further used to monitor healing response to an infarct event at various times from injury, or in remodeling of grafts in heart, for example. The understanding of these matrices and remodeling could help understanding many important physiological diseases, such as biomechanical origin of arrhythmia etc.

In human facial skin, several aesthetic units were selected to be imaged using PSOCT to show their corresponding collagen organizations. These regions include the thinnest facial skin (eyelid) to the thickest facial skin (glabella) and demonstrate applicability of PSOCT throughout facial skin. These are also the areas commonly affected by skin cancer, which often requires surgical resection and reconstruction with tissue flaps. Minimizing wound tension and orienting incisions along skin tension lines is clinically critical in optimal scar healing reconstruction of facial defects.

Numerous methods describing skin tension lines exist. One of the earliest methods is Langer's Lines, based on the natural elliptical tendency of circular wounds created in a cadaver². The most commonly employed method in modern surgery is the Relaxed Skin Tension Lines, determined by pinching skin and observing furrows in the living body³. No available method has been formulated with objective knowledge of the collagen fiber organizations. The method proposed in this study enables fast, invivo, non-invasive, wide field and depth-resolved collagen orientation imaging, providing an additional metric to give insight into collagen organizations, which make up RSTLs in each individual living subject.

While we have demonstrated that the DDG-based PST method can be used to extract depth-resolved collagen organization using the single input PSOCT system, further improvement is required. We neglected the dichroism (i.e., the anisotropic scattering attenuation of incident light)¹⁶ of the sample in our current treatment. As the attenuation is one of important parameters in some ophthalmologic studies to characterize the features of the diseases⁴¹, further improvement is required if the diattenuation property of the sample is of concern. Previous studies have shown that the attenuation of the sample can twist the circular curve out of its osculating plane, and hence the trajectory of the output polarization states would become a spiral curve rather than a circular curve at the Poincare sphere⁴². One potential solution to evaluate the attenuation property of the sample is to calculate the torsion value of the trajectory curve and then obtain the degree of the curve twisting out of the plane of the curvature. The bigger the absolute value of the torsion is, the stronger the attenuation would be. In addition, multiple scattering in turbid tissue is known to limit polarization imaging depth and contrast when it is not being considered in the model formulation. Optical clear ing^{43-45} , a technique that can reduce scattering in the skin and is biologically compatible with cosmetic procedures, may be employed together with PSOCT imaging in future studies to increase the probing depth and contrast.

Finally, the simplicity of design in PSOCT and the widespread clinical use of traditional OCT imaging suggest that birefringent information may serve as an additional contrast from which clinicians may pull from to make interventional decisions. OCT has been used clinically for visualizing vascular function in various pathological states⁴⁶, as well as to detect changes in light-scattering properties of fibers associated with the healing process of burn wounds⁴⁷. More recent studies have also introduced non-contact measurements of elasticity using optical coherence elastography, where biomechanical anisotropy has been shown to generally agree with collagen fiber orientation⁴⁸. Together, a non-contact OCT imaging modality coupled with polarization-sensitive measurements has the potential to provide clinicians with multiple contrast mechanisms in a single scan, providing a wealth of diagnostic information in a readily translatable package. In summary, we expect that the proposed PSOCT technique will enable superior contrast and diagnostic capabilities compared to conventional OCT because of its ability to reveal micro- and macroscopic structural features. Potential clinical applications of PSOCT described here include early detection of acute myocardial infarction, evaluation of scar formation and the imaging-guided plastic surgery. In addition, the significant simplification of the PSOCT imaging system facilitates the clinical translation of the PSOCT imaging technique, which may provide a new matrix of diagnostic information.

Material and methods

Discrete differential geometry-based PST method

In Stokes space, a linear polarization can be modeled as a 3D rotation, where the rotation axis represents the optic axis, and the amount of rotation is the degree of phase retardation²³. That is, when a polarized light propagates through a multi-layered material with a constant optic axis (i.e. material with a constant optic axis but experiencing phase retardation), the evolutional trajectory of the polarization state of the light beam must form a spatial circular curve on the Poincaré sphere. The osculating plane of this circular curve is the rotation plane of the linear polarization. Once this osculating plane is determined, the rotation information, i.e., both the rotation axis representing the optic axis and the rotation angle representing the phase retardation, can be determined. Hence, determining the osculating plane of the curve formed by the evolutional trajectory of the polarization state is the key to derive the local optic axis and phase retardation of a multi-layered material.

One such method to determine the osculating plane is based on discrete-differential geometry (DDG). The DDG analysis computes a set of '*TNB*' orthonormal bases in 3D space where *T* is the tangent vector, *N* is the normal vector and *B* is the binormal vector of the spatial curve which are then used to determine the osculating plane (i.e., the plane that *T* and *N* vectors lie) at each point of the curve²⁸. Since PSOCT is based on a round-trip measurement, the measured osculating plane is the apparent plane defined by the accumulated polarization rather than the actual osculating plane.

To retrieve local birefringent information using DDG analysis, a PSOCT-based polarization state transmission model that describes the polarization state evolution in a round-trip measurement is proposed and described herein. This model reveals the relation between local birefringent parameters and the evolution behaviors of the output polarization state in PSOCT. Based on this relationship, the DDG-based PST method is combined with a set of 3D rotation operations to derive the local optic axis and phase retardation from the measurements.

In what follows, we show how the *TNB* vectors are determined using the DDG method on the trajectory of the

output polarization states. Then, we show how we utilize the *TNB* vectors to derive the local optic axis and local phase retardation in the PSOCT-based polarization state transmission model, which reveals the relation between local birefringent parameters and the evolution behavior of the output polarization states in the PSOCT system.

In Poincare representation, the trajectory of the output polarization state can be considered as a discrete spatial curve by connecting a sequence of measured data points: $P_n(n = 1, 2, 3...)$, where P_n represents the vector of output polarization state as a function of discrete pixel locations, n, along the depth. We refer to this discrete spatial curve as the polarization state curve. Hence, a sequence of the right-handed discrete Frenet-frames can be defined and computed by the DDG method as⁴⁹

$$K_n = (T_n, N_n, B_n)k = 1, 2, 3...$$
(1)

where

$$T_n = \frac{P_{n+1} - P_n}{|P_{n+1} - P_n|}$$

$$B_n = \frac{T_{n-1} \times T_n}{|T_{n-1} \times T_n|}$$

$$N_n = B_n \times T_n$$
(2)

 T_n , N_n and B_n are the unit tangent, normal and binormal vectors, respectively. The osculating plane at each point is

spanned by the corresponding T and N vectors. Since B_n is the cross-product between T_n and N_n (follows the righthand rule), it is orthogonal to the osculating plane and thus includes information related to the optic axis⁵⁰. Note that the osculating plane directly provided by the *TNB* vectors is the apparent osculating plane that not only carries information of the localized tissue, but also includes the accumulated information of all layers on top of it.

Next, we describe the PSOCT-based polarization state transmission model, with which the TNB vectors are combined with a set of 3D rotation operations to derive the local optic axis of a multi-layered sample with depth-varying optic axes. To illustrate this model, the polarization states of a light beam traveling through a representative birefringent sample is schematically shown in Fig. 5. To simplify, a simulated sample is used with two groups of birefringent material with different optic axes $(A_1 \text{ and } A_2)$, respectively (Fig. 5a). The first group consists of two retarder layers (blue layer) sharing the optic axis of A_1 , whereas the 2nd group also consists of two retarder layers (yellow layer) sharing the optic axis of A_2 . When the light beam propagates within this sample, each of the five interfaces back-scatter the incoming light toward the PSOCT detector to form an A-scan and the corresponding output polarization states are P_0 , P_1 , P_2 , P_3 and P_4 ,



Fig. 5 Schematic diagram of the PSOCT-based polarization state transmission model. Shown is the model in a simulated birefringent sample with depth-varying optic axis, representing a A-scan in the imaging. P_0 , P_1 , P_2 , P_3 and P_4 , are the output polarization states that are detected by the PSOCT system. **a** A depth scan of a simulated birefringent sample with depth-varying optics axis, where 4 birefringent layers are simulated with the first 2 layers sharing the same optic axis A_1 , and the last two layers sharing A_2 . V_2 , V_3 and V_4 are the intermediate polarization state that are only influenced by the local birefringence. **b**The trajectory curve of the output polarization states P_0 , P_1 , P_2 , P_3 and P_4 on the Poincaré sphere with the corresponding TNB vectors. The measured osculating planes spanned by the T and N vectors are colored by blue. **c** The geometric relation between the upper optic axes, $A_1(i.e., B_1)$, the axis of the measured osculating plane B_2 and the local optic axis A_2 . The actual osculating plane is colored by red. **d** A depth scan of a simulated birefringent sample with depth-varying optic axis. **e** The actual osculating plane composed by P_{m-1} to P_n . O' (pink points) and O'' (blue points) are the center of the actual and measured osculating planes, respectively. Red, green and blue arrows represent the tangent (T), normal (N) and binormal (B) vectors, respectively

respectively. The trace of the output polarization state from P_0 to P_4 forms a discrete curve on the Poincare sphere surface. DDG computation is then applied to this polarization state curve to determine the *TNB* vectors (red, green and blue vectors represent *T*, *N* and *B* vectors respectively), as shown in Fig. 5b.

Specifically, for light beams scattered back from the sample surface and the first two blue layers, the output polarization states P_0 , P_1 and P_2 are represented by the black points on the Poincaré sphere (Fig. 5b). Since the first two layers share the same optic axis A_1 , the polarization state curve of P_0 , P_1 and P_2 on the Poincare sphere must follow a circular curve whose osculating plane is the rotation plane. For these two surface layers, the binormal vector B_1 (which is orthogonal to the osculation plane) is equal to the optic axis A_1 based on the linear polarization rotation model mentioned above:

$$A_1 = B_1 \tag{3}$$

For output polarization states scattered back from deeper layers with a different optic axis, the corresponding binormal vectors no longer represent the local optic axes. Instead, there is a 3D rotation between the binormal vectors and the exact optic axes in the specific layer of interest. This is why the differential geometry method alone can only determine the optic axis in a homogeneous sample rather than an inhomogeneous sample with varying optic axes (such as the mesh-like collagen fibers in the dermis and the myocardial collagen fibers)^{42,51}.

Here, we discuss in detail the 3D rotation relationship among the optic axes, the binormal vectors of the polarization state curve, and the local optic axis of interest, which is required to derive the local optic axis progressively from superficial to deep tissue locations. Figure 5c illustrates the geometric relationship among the upper optic axes by highlighting the transmission process of the polarization states in the sample. On the Poincare sphere, the black points represent measured output polarization states P_0 , P_1 , P_2 , P_3 and P_4 while the red points V_2 , V_3 and V_4 represent the intermediate polarization states of light when they pass through the interfaces (Fig. 5a). These intermediate states are chosen to be shown because the change in the polarization state from V_2 to V_3 and V_2 to V_4 is only determined by the yellow layers (Fig. 5a), representing the information of the region of interest (ROI) in the tissue without accumulation effect. Hence, the trajectory of these three points must follow along another circular curve on the Poincare sphere, whose binormal vector is equal to the optic axis A_2 of the yellow layers. We call the osculating plane of this curve (determined by V_2 , V_3 and V_4) the actual osculating plane. Although the trajectory of V_2 , V_3 and V_4 includes pure information of the local axis of ROI, they are the intermediate states which cannot be detected directly due to the round-trip measurement of PSOCT. Instead, they are each modified when light passes through the upper blue layers again to form the resultant output polarization states P_2 , P_3 and P_4 .

These modifications induced by the double-passage of the backscattered light are the same for all intermediate polarization states (i.e., V_2 to P_2 , V_3 to P_3 , V_4 to P_4) and can be viewed as a 3D rotation in the Poincare representation because they pass through the same upper blue layers as shown in Fig. 5a. That is, the actual osculating plane of V_2 , V_3 and V_4 experiences a 3D rigid rotation about the axis of the upper layers A_1 (by an angle $\delta =$ $\delta_1 + \delta_2$, where δ_1 and δ_2 are the local phase retardation of the first two layers) to form the measured osculating plane of P_2 , P_3 and P_4 , whose binormal vector B_2 can be directly obtained using the DDG method as shown in Fig. 5b. Hence, the local optic axis A_2 of the yellow layers can be obtained by rotating the binormal vector B_2 about B_1 by - δ as shown in Fig. 5c. This geometric relationship can be expressed as a matrix rotation:

$$A_2 = R_1(-\delta; A_1)B_2 \tag{4}$$

where A_1 , A_2 and B_2 are the 1×3 matrices represented by the corresponding Q, U and V values; $R_1(-\delta; A_1)$ is the 3D rotation matrix determined by A_1 and $-\delta$.

Equation 4 can be generalized for the sample with multiple varied optic axes along depth. The actual osculating plane in the layer of interest would experience a set of 3D rotations when the light beam passes through all upper layers again (due to double-passage). Each upper layer would rotate the actual osculating plane once with the rotation matrix determined by the corresponding layer's local optic axis and local phase retardation. Since the normal vector of the actual osculating plane is the local optic axis of the layer of interest, it also experiences the same set of rotation to form the binormal vector B_n , which is orthogonal to the measured osculating plane and can be computed by the DDG method directly. Hence, the final local optic axis A_n can be obtained by applying a set of 3D rotation operations to the binormal vector B_n :

$$A_n = R_{n-1}(-\delta_{n-1}; A_{n-1})R_{n-2}(-\delta_{n-2}; A_{n-2})\dots R_1(-\delta_1; A_1)B_n$$
(5)

From this equation, the local optic axis can be derived layer by layer using the TNB vectors of the polarization state curve and the 3D rotation matrix of each upper layer.

Finally, we describe how to use the TNB vectors to compute the local phase retardation. Figure 5e shows the actual osculating plane of the n-th layer in Fig. 5d. In this plane, the local phase retardation δ_n is half the angle that

rotates the local input polarization state S_n^{in} about the local optic axis to the local output polarization S_n^{out} . That is, $\delta_n = \frac{1}{2} \angle S_n^{in} O' S_n^{out}$. Consider the round-trip measurement, $\phi_{n-1} = \sum_{i=m}^{i=n-1} \delta_i = \angle V_{m-1} O' S_n^{in} = \angle S_n^{in} O' V_{n-1} = \angle S_n^{out} O' V_n$, hence, $\delta_n = \frac{1}{2} \angle S_n^{in} O' S_n^{out} = \frac{1}{2} \angle V_{n-1} O' V_n$. As mentioned above, there is a rigid rotation of the actual osculating plane to form the measured osculating plane $(P_{m-1} \dots P_{n-1} P_n)$ when the light passes through all the upper layers once again. Then we can get $\delta_n = \frac{1}{2} \angle V_{n-1} O' V_n = \frac{1}{2} \angle P_{n-1} O' P_n$, which is half the angle between the adjacent *N* vectors as shown in Fig. 5f. Thus, the local phase retardation can be expressed as

$$\delta_n = \frac{1}{2} \arccos \frac{N_{n-1} \cdot N_n}{|N_{n-1}| |N_n|} \tag{6}$$

Equations 5 and 6 show that based on the PSOCT-based polarization state transmission model, the local axis orientation and local phase retardation can be derived using a DDG-based PST method combined with a set of 3D rotation using only one single polarization state.

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Author details

¹Department of Bioengineering, University of Washington, 3720 15th Ave NE, Seattle, WA 98195, USA. ²Department of Otolaryngology- Head and Neck Surgery, Facial Plastic and Reconstructive Surgery, University of Washington, Seattle, WA 98195, USA. ³Department of Pathology, University of Washington, Seattle, WA 98109, USA. ⁴Center for Cardiovascular Biology, University of Washington, Seattle, WA 98109, USA. ⁵Institute for Stem Cell & Regenerative Medicine, University of Washington, Seattle, WA 98109, USA. ⁶Department of Ophthalmology, University of Washington, Seattle, WA 98105, USA

Author contributions

R. K. W. conceived and supervised the project. P.T. developed the algorithm based on an initial concept, conducted experiments, and performed data analysis. P. T., N.Z., N. L., and Y. L. prepared the samples. The manuscript was jointly written by P.T., M. A. K., and R.K.W. and revised by all authors.

Conflict of interest

The authors declare no competing interests.

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